

Dynamical modeling of reaction networksMathematics of system biology

Romain Yvinec

► To cite this version:

Romain Yvinec. Dynamical modeling of reaction networksMathematics of system biology. 2020 Workshop - 'bioinformatics and biomathematical approaches to integrate the GPCR signal, Nov 2020, Online, France. pp.1-70. hal-03115099

HAL Id: hal-03115099

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Dynamical modeling of reaction networks

Mathematics of system biology

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Systems Biology and Networks

Motivations and Objectives

Chemical reaction network formalism

Parameter estimation

Applications

Outline

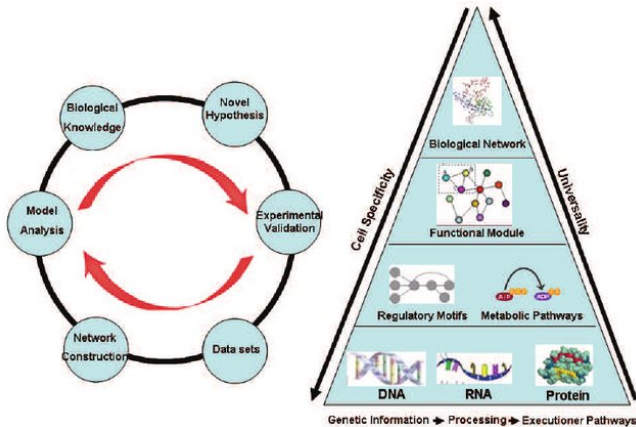
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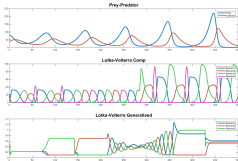
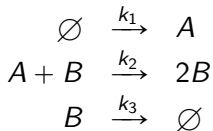


Oltvai and Barabasi, Science 25 :763-764, 2002.

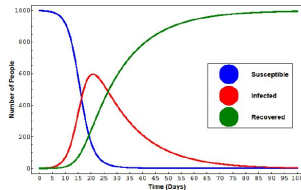
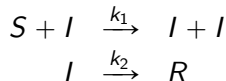
Small networks in Population dynamics

(Interactions between populations, Epidemiology)

Lotka-Volterra model



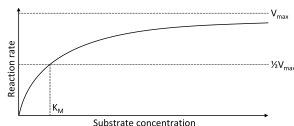
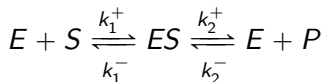
S.I.R model



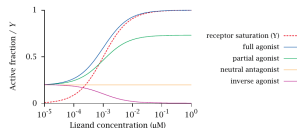
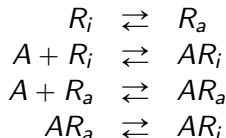
Small networks in molecular biology

('Toy' molecular models with isolated components)

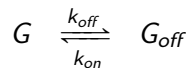
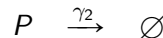
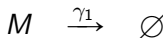
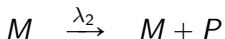
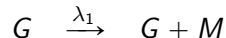
Enzymatic kinetics



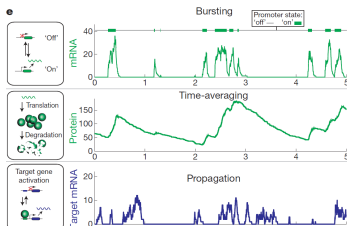
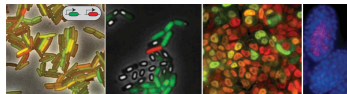
Pharmacology model



(Single) Gene Expression



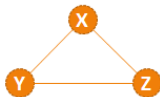
Eldar and Elowitz (Nature 2010)



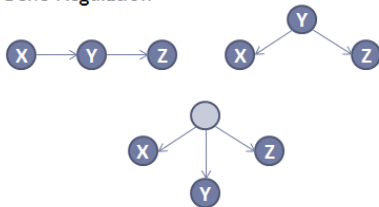
Co-expression genes network

Small motifs

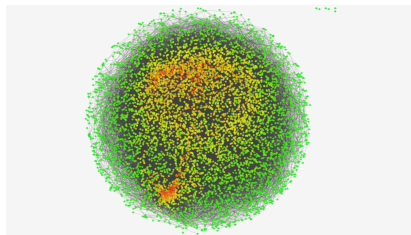
Gene Co-expression



Gene Regulation

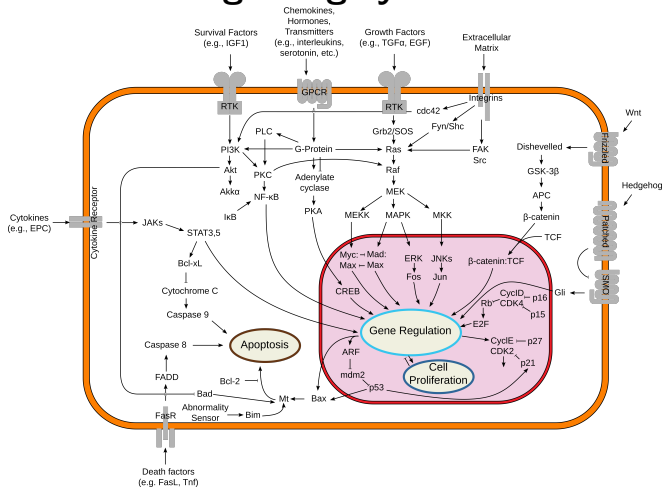


Large networks



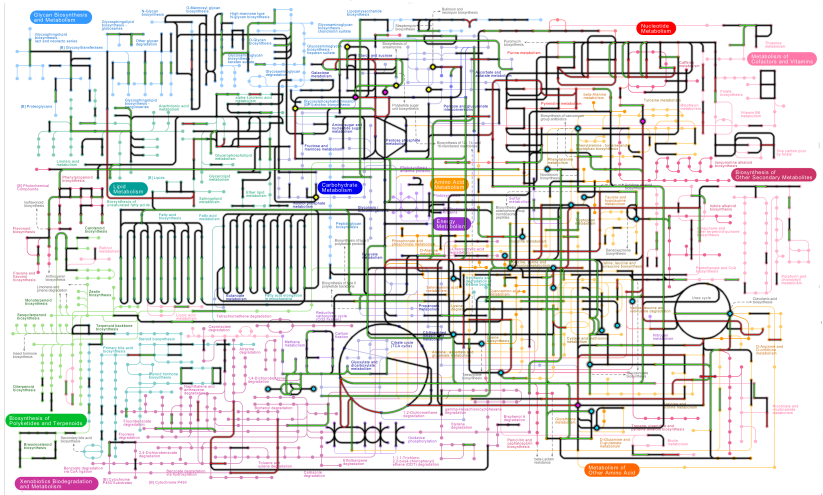
Systems Biology and Networks at different scales

Signaling system



Systems Biology and Networks at different scales

Metabolomic Network



Outline

Systems Biology and Networks

Motivations and Objectives

Chemical reaction network formalism

Parameter estimation

Applications

Possible applications of mathematical modelling

- ▶ Understand non-trivial behavior of a biological system (by reproducing this behavior with an understandable model, starting from 'first principles')
- ▶ Help to identify key regulatory process in signaling cascades
- ▶ Quantify some non-observables quantities, in particular : molecules concentrations, reaction rates.

Possible applications of mathematical modelling

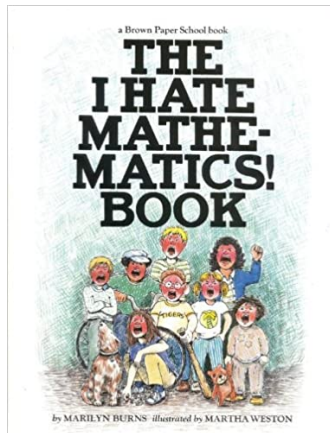
Today : Understand the mathematical formalism of dynamical reactions network

Possible applications of mathematical modelling

Today : Understand the mathematical formalism of dynamical reactions network

- ▶ Build a model from a network of interactions [Cell Designer]
- ▶ Parameter calibration with kinetic data [GraphPad Prism / Copasi]

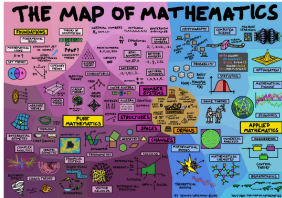
Warning !



#Ihatemathematics

The following couples of slides contain some abstract notions...
Why that ?

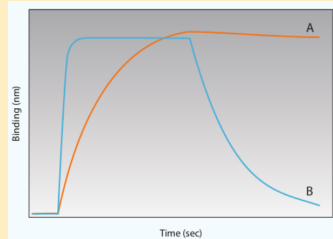
Maths is about structures...and is generic !



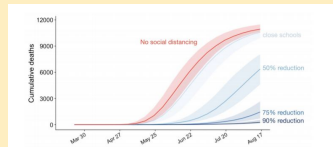
Reactions networks applications range from

- ▶ Chemistry
- ▶ molecular biology
- ▶ epidemiology
- ▶ and beyond !

Binding experiments



Covid-19 models



Outline

Systems Biology and Networks

Motivations and Objectives

Chemical reaction network formalism

Parameter estimation

Applications

Chemical Reaction Network, vocabulary

Definition

A **chemical reaction network** is given by three sets $(\mathcal{S}, \mathcal{C}, \mathcal{R})$:

- **Species**, $\mathcal{S} := \{S_1, \dots, S_d\}$: molecules that undergo a series of chemical reactions.
- **Reactant / Product**, $\mathcal{C} := \{y^1, \dots, y^n\}$: Linear combination of species, that represent either 'what is consumed', or 'what is produced', in any reaction.
- **Reaction**, $\mathcal{R} := \{y^k \rightarrow y^{k'}, y^k, y^{k'} \in \mathcal{C}\}$: ensemble of reactions between species or combination of species (directed graph between Reactant / Product).

Chemical Reaction Network, vocabulary

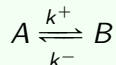
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- **Mass-action law**, κ : a list of positive parameter (kinetic rate) for each reaction in \mathcal{R}

Chemical Reaction Network, vocabulary

Example



Species $\mathcal{E} := \{A, B\}$

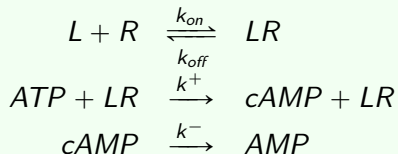
R / P $\mathcal{C} := \{A, B\}$

Reaction $\mathcal{R} := \{A \rightarrow B, B \rightarrow A\}$

Rate $\{k^+, k^-\}$

Chemical Reaction Network, vocabulary

Example (minimal cAMP production model)



Species $\mathcal{E} := \{L, R, LR, ATP, cAMP, AMP\}$

R / P $\mathcal{C} := \{L + R, LR, ATP + LR, cAMP + LR, cAMP, AMP\}$

Reaction $\mathcal{R} := \{L + R \rightarrow LR, LR \rightarrow L + R, ATP + LR \rightarrow cAMP + LR, cAMP \rightarrow AMP\}$

Rate $\{k_{on}, k_{off}, k^+, k^-\}$

Chemical Reaction Network, FSHR-induced cAMP signals

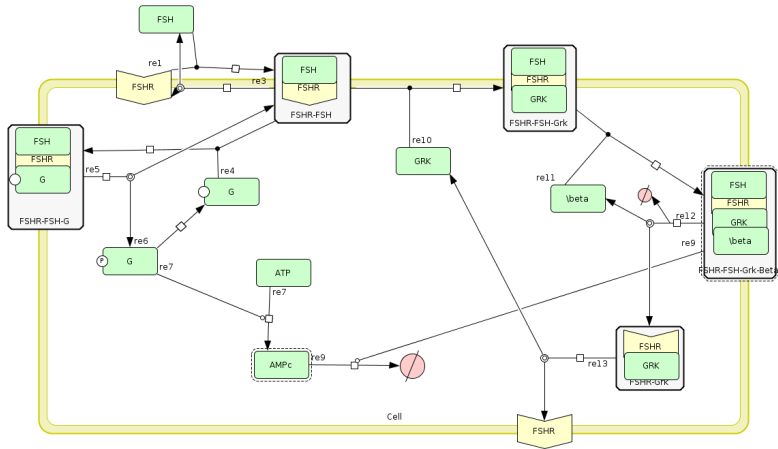
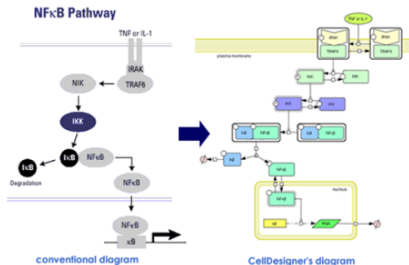


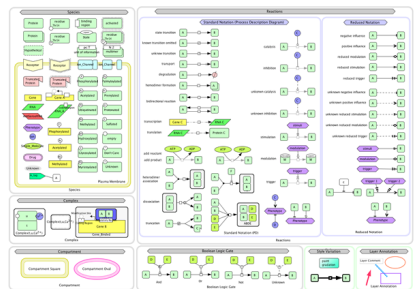
Figure – FSHR (Gαs-coupled GPCR) models build on CellDesigner

Cell Designer

About diagrams and layout...



...with well-defined conventions



Funahashi, A., Tanimura, N., Morohashi, M., and Kitano, H.,
CellDesigner : a process diagram editor for gene-regulatory and
biochemical networks, BIOSILICO, 1 :159-162, 2003

Chemical Reaction Network, "real" example

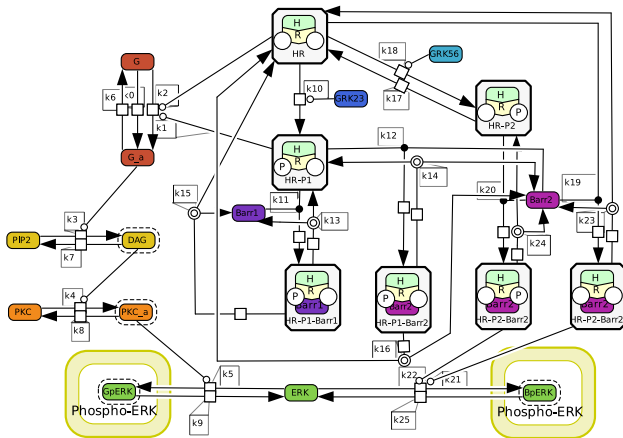


Figure – ERK Phosphorylation pathways build on CellDesigner, Heitzler et al. MSB 2012

Summary so far

We have seen

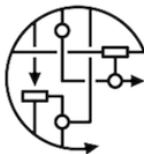
- ▶ Many examples of dynamical system biology models
- ▶ The formalism of *reaction network* models
- ▶ How to *build* a reaction network within Cell Designer

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NB : there exists public databases of reaction network models.



Pathguide the pathway resource list



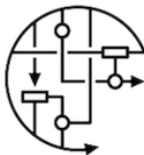
KEGG NETWORK Database
From gene variation to network variation

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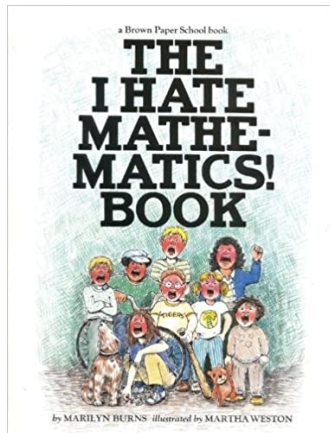
NB (bis) : A reaction network is a network... but a network is
NOT a reaction network !

Summary so far

We have seen

- ▶ Many examples of dynamical system biology models
- ▶ The formalism of *reaction network* models
- ▶ How to *build* a reaction network within Cell Designer
- ▶ **What about dynamics ?**

Warning !



#Ihatemathematics

The following couples of slides contain some abstract notions...let's try to catch the meaning !

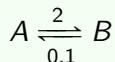
Chemical Reaction Network and Dynamical models

We build a model that

- Keep track of **concentration** of species along **time**.
- Satisfy **Law of Mass action** : The velocity of a reaction is proportional to the concentrations of its reactants.
- Is a system of Ordinary Differential Equations, in which reactions are "added" on top of each other, e.g. they happens **continuously** and **simultaneously**.

Chemical Reaction Network and Dynamical models

Example



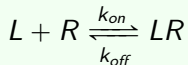
$$\frac{dx_A}{dt}(t) = -0.1x_A(t) + 2x_B(t), \quad x_A(t=0) = A_{tot}$$

$$\frac{dx_B}{dt} = +0.1x_A(t) - 2x_B(t), \quad x_B(t=0) = 0$$

$x_A(t)$ = time dependent concentration of species A

Chemical Reaction Network and Dynamical models

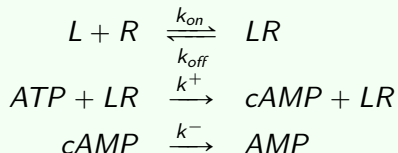
Example



$$\begin{aligned}\frac{dx_L}{dt}(t) &= -k_{on}x_L(t)x_R(t) + k_{off}x_{LR}(t), & x_L(0) &= Dose \\ \frac{dx_R}{dt}(t) &= -k_{on}x_L(t)x_R(t) + k_{off}x_{LR}(t), & x_R(0) &= R_{tot} \\ \frac{dx_{LR}}{dt}(t) &= k_{on}x_L(t)x_R(t) - k_{off}x_{LR}(t), & x_{LR}(0) &= 0.\end{aligned}$$

Chemical Reaction Network and Dynamical models

Example (minimal cAMP production model)



$$\begin{aligned} \frac{dx_L}{dt} &= -k_{on}x_Lx_R + k_{off}x_{LR}, & x_L(0) &= Dose \\ \frac{dx_R}{dt} &= -k_{on}x_Lx_R + k_{off}x_{LR}, & x_R(0) &= R_{tot} \\ \frac{dx_{LR}}{dt} &= k_{on}x_Lx_R - k_{off}x_{LR}, & x_{LR}(0) &= 0 \\ \frac{dx_{cAMP}}{dt} &= k^+x_{ATP}x_{LR} - k^-x_{cAMP}, & x_{cAMP}(0) &= 0 \\ \frac{dx_{ATP}}{dt} &= -k^+x_{ATP}x_{LR} & x_{ATP}(0) &= ATP_{tot}. \end{aligned}$$

But what is an "Ordinary Differential Equation"? A math theory in one slide !

The equation

$$\frac{dx}{dt} = v(x),$$

is numerically solved by successive time-step iteration, of small length $\Delta t \ll 1$:

- 1) Start at *a given initial condition* x_0 at time $t_0 = 0$

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- 2) To calculate the value of x at the first time step, remember that (*assuming constant speed*)

Final Position = Initial Position + velocity * Time ,

which becomes, in mathematical notations,

$$x(\Delta t) = x_0 + v(x_0) * \Delta t ,$$

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which becomes, in mathematical notations,

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Iterate : To calculate the value of x at the next time step, use

$$x((i + 1) * \Delta t) = x(i * \Delta t) + v(x(i * \Delta t)) * \Delta t ,$$

But what is an "Ordinary Differential Equation"? A math theory in one slide...and a figure!

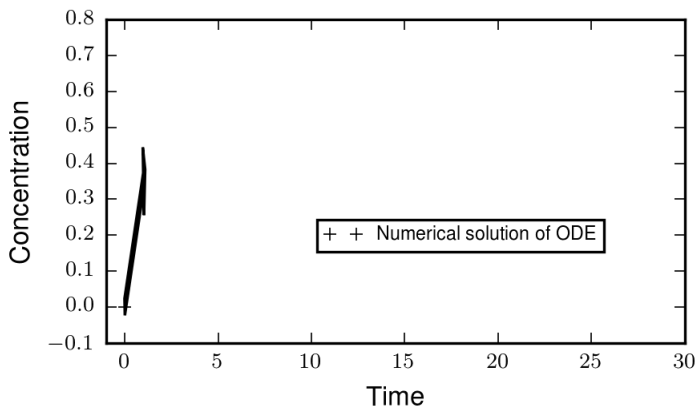


Figure – Solving an ODE

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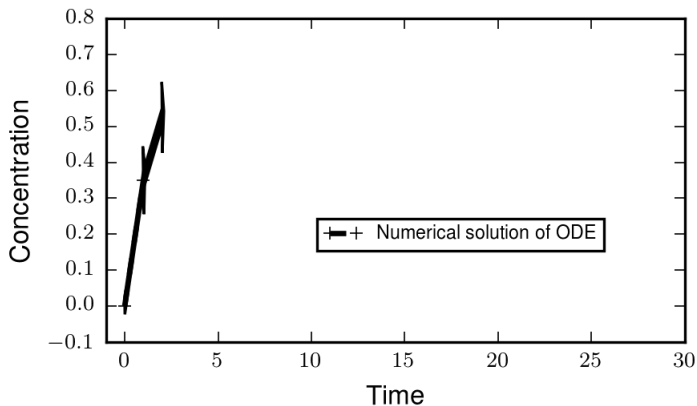


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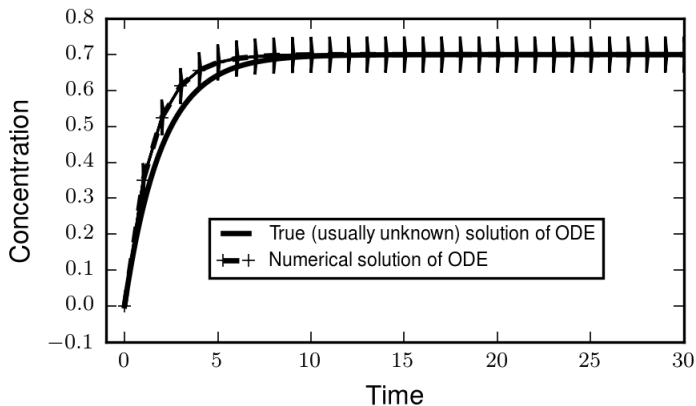
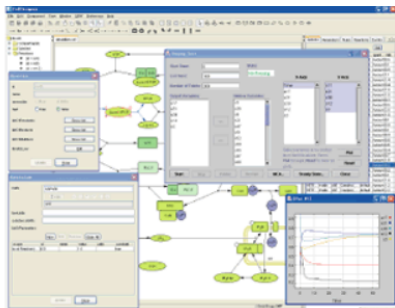
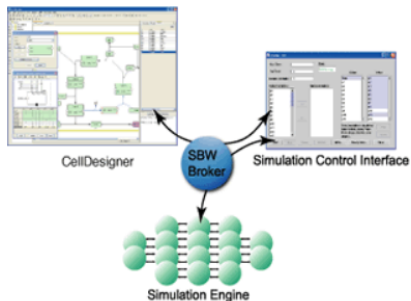


Figure – Solving an ODE

Solving an ODE in practice : no need to code !

ODE solver within Cell Designer



Funahashi, A., Tanimura, N., Morohashi, M., and Kitano, H.,
CellDesigner : a process diagram editor for gene-regulatory and
biochemical networks, BIOSILICO, 1 :159-162, 2003

Summary so far

We have seen

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NB : You don't need to code, but you need to specify kinetic rate and initial condition values to simulate a reaction network.

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NB : You don't need to code, but you need to specify kinetic rate and initial condition values to simulate a reaction network.

NB (bis) : You can play with this tools to "explore" the behavior of a model. But that can be time consuming and inefficient...

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What about inferring those values from data ?

Outline

Systems Biology and Networks

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Chemical reaction network formalism

Parameter estimation

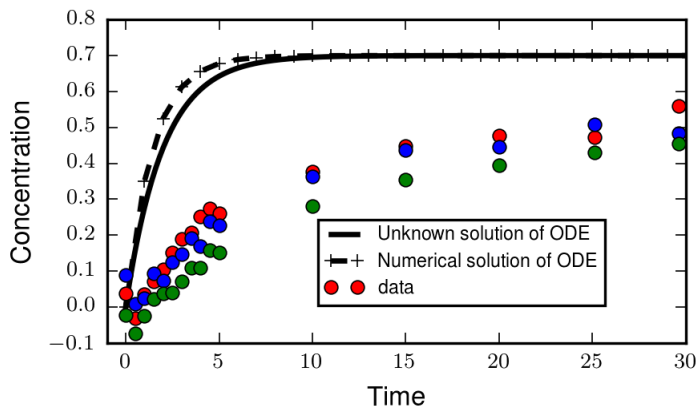
Applications

Parameter and network inference in Chemical Reaction Network

Goal : Given some time series data, find the minimal (biologically plausible) reaction network with its parameter (=reaction rates and initial conditions) that fits consistently the data.

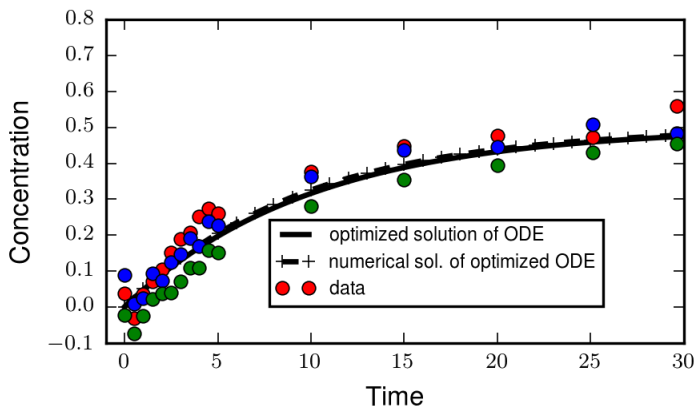
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Parameter and network inference in Chemical Reaction Network

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Regression analysis and Parameter estimation with time series : What is difficult ?

- ▶ In linear models, there exists a *unique optimal* solution
- ▶ Yet in practice, (generalized) linear models do not perform well on biochemical data due to **Heteroscedasticity** and **highly dependent time point** data.

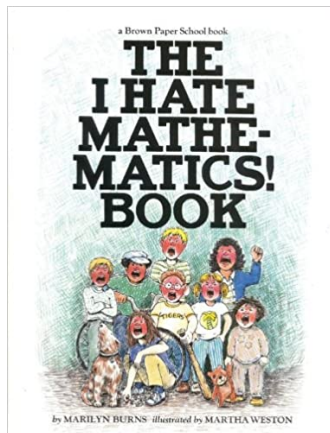
Regression analysis and Parameter estimation with time series : What is difficult ?

- ▶ For most of (nonlinear) reaction network, there is no guarantee to find a unique optimal solution.
- ▶ Reaction network models allows to perform multifactorial analysis ("Anova-like")

Regression analysis and Parameter estimation with time series : What is difficult ?

- ▶ For most of (nonlinear) reaction network, there is no guarantee to find a unique optimal solution.
- ▶ Reaction network models allows to perform multifactorial analysis ("Anova-like")
- ▶ Many other tools exists from the statistical field of *time series analysis*.

Warning !



#Ihatemathematics

The following couples of slides contain some abstract notions...*but that the last ones!*

Parameter and network optimization in Chemical Reaction Network

Goal : Given some time series data, find the minimal (biologically plausible) reaction network with its parameter (=reaction rates and initial conditions) that fits consistently the data.

Strategy 1) From a given network $(\mathcal{S}, \mathcal{C}, \mathcal{R})$, with given parameter values, solve the ODEs,

$$\frac{dx}{dt} = v(x, k), \quad x(0) = x_0,$$

and compute a **distance** between the solution and the data.

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Strategy 2) Using **optimization** algorithms, find the best parameter values k, x_0 , to minimize the distance

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Strategy 3) If needed, change the reaction network (add or delete species/reactions)

Parameter and network optimization in Chemical Reaction Network

Goal : Given some time series data, find the minimal (biologically plausible) reaction network with its parameter (=reaction rates and initial conditions) that fits consistently the data.

Statistics There exists a well developed statistical theory to assess the **quality of a fit** and to give **confidence interval** on parameter values (-> See Likelihood maximization or Bayesian statistics).

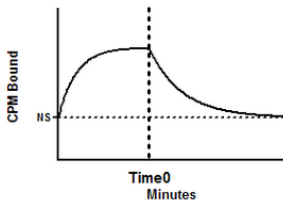
Parameter estimation in



Predefined or user-defined time-dependent equations

Model

Radioligand=HotNM*1e-9
Kob=[Radioligand]*Kon+Koff
Kd=Koff/Kon
Eq=Bmax*radioligand/(radioligand + Kd)
Association=Eq*(1-exp(-1*Kob*X))
YatTime0 = Eq*(1-exp(-1*Kob*Time0))
Dissociation= YatTime0*exp(-1*Koff*(X-Time0))
Y=IF(X<Time0, Association, Dissociation) + NS



Parameter estimation in

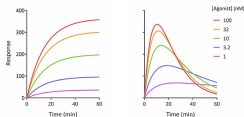


- ▶ Limited to *solvable* models
- ▶ Adapted to analyze one single output at a time, assuming excess of Ligand.

Pharmechanics

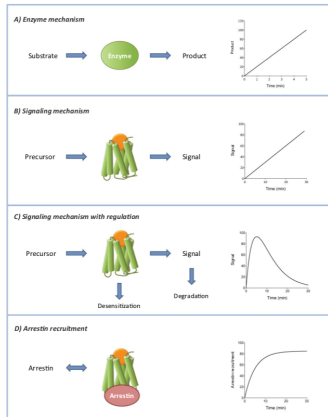
Pharmacology Data Analysis
and Consulting

HOME DATA ANALYSIS CURVE FITTING CONSULTING ABOUT CONTACT

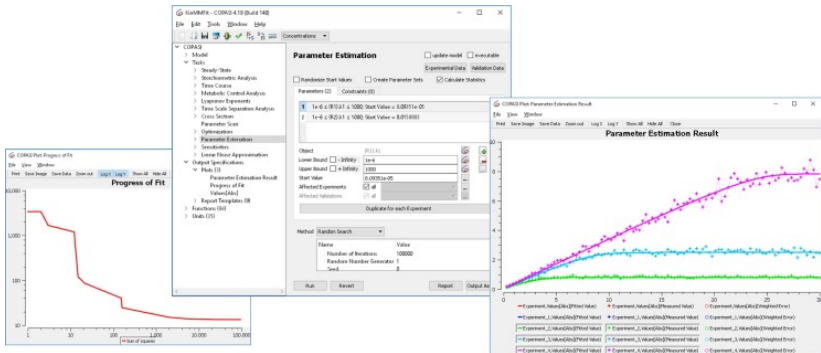


Hoare et al., Analyzing kinetic signaling data for G-protein-coupled receptors, Scientific Reports 10(1) :12263 2020

Predefined or user-defined time-dependent equations



Parameter estimation in Copasi



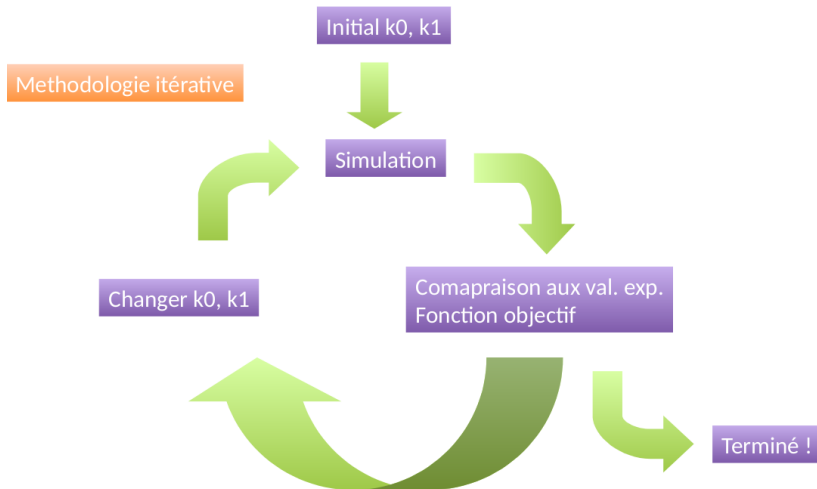
- ▶ Models can be imported from Cell Designer.
- ▶ Supports both graphical interface and command line.



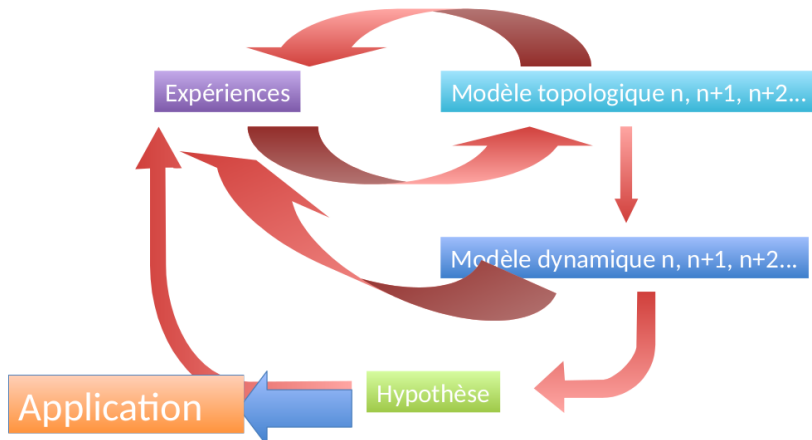
Bergman et al. COPASI and its applications in biotechnology, Journal of Biotechnology 261 :215-220, 2017.

Hoops et al. COPASI : a COMplex PATHway Simulator. Bioinformatics 22 :3067-74, 2006.

Remember ! it's an iterative and interdisciplinary workflow !

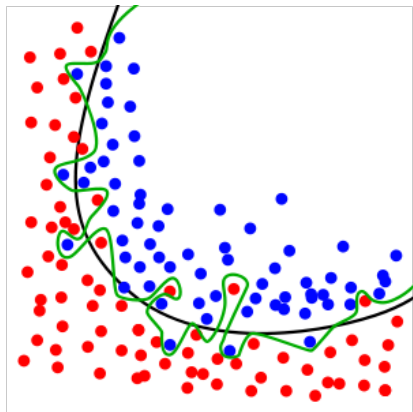


Remember ! it's an iterative and interdisciplinary workflow !



Is the monkey who typed Hamlet actually a good writer ?

Overfitting



- ▶ There is a trade-off between toy minimal models and detailed biochemistry pathways.
- ▶ Overfitting leads to **unreliable** prediction and **meaningless** model / parameter value.
- ▶ (Advanced) statistical tools exist to sort this out : **model selection** (especially for hierarchical models) and **parameter identifiability**.

Summary so far

We have seen

- ▶ Many examples of dynamical system biology models
- ▶ The formalism of dynamical reaction network models
- ▶ How to build and simulate a reaction network model within Cell Designer.
- ▶ How to calibrate parameters of a dynamical reaction network model with GraphPad Prism and/or Copasi.

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NB : The full workflow can be long and require collaboration with statistician / applied mathematician.

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NB bis : **What about applications ?** Go to session 8 :
Computational approaches !

Outline

Systems Biology and Networks

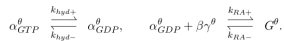
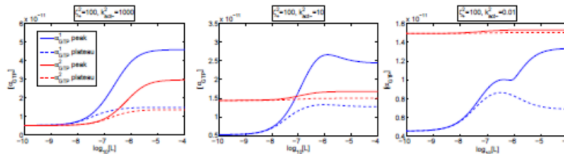
Motivations and Objectives

Chemical reaction network formalism

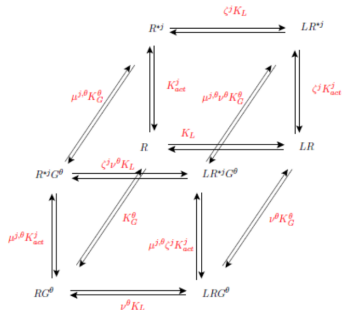
Parameter estimation

Applications

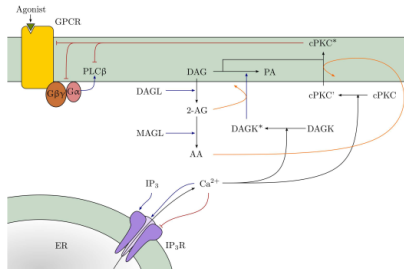
Some applications : Understanding G protein activation cycle



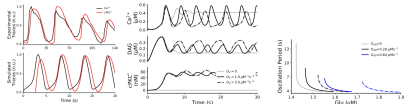
Bridge, Meads, Frattini,
Winfield, Ladds, Modelling and
simulation of biased agonism
dynamics at a G protein-coupled
receptor, J. Theoret. Biol.
442 :44–65, 2018



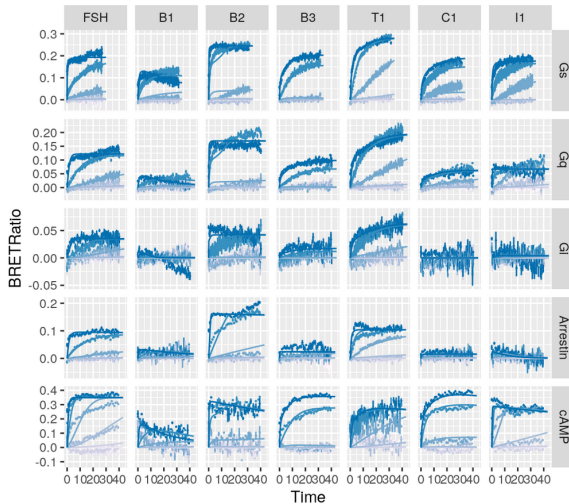
Some applications : Shedding light on GPCR-induced Calcium oscillations in Astrocytes



De Pittà, Ben-Jacob, Berry, G protein-coupled receptor-mediated calcium signaling in astrocytes, in Computational Glioscience, Springer 2019.



Some applications : Revisiting signaling bias using dynamical model



De Pascali, ..., R.Y,..., *in preparation*.

Conclusions

- ▶ Dynamical reaction network framework has many different applications.
- ▶ Its a powerful framework to reveal comprehensive spatio-temporal patterns behind GPCR signaling complexities.
- ▶ Its a powerful framework to analyze quantitatively time series data in GPCR signaling.
- ▶ Adequate tools foster necessary interdisciplinary collaborations by providing a common language.